

# ***MODELING PILOT PERFORMANCE USING AUTOMATED AIRCRAFT SYSTEMS***



**George Mason Research Team  
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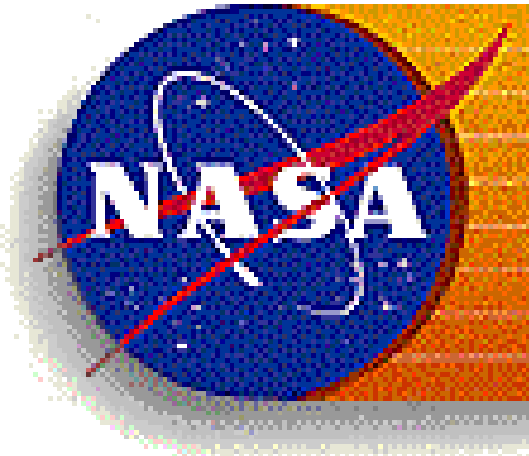
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# *Project Support*

Office of the Chief Scientific and  
Technical Advisor for Human  
Factors: AAR-100



NASA Ames Research  
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Aviation Systems  
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Simulation Division





# *Overview*

## ➤ Model pilot performance

- Understand cognitive processes underlying pilot performance in automated cockpit

## ➤ Single pilot Model

- Single pilot model interacting with dynamic automation system

## ➤ Crew Model

- Captain and First Officer pilot models “communicating” to each other



# *Modeling a single pilot system*

- Context: Single pilot operating an automated commercial aircraft during descent phase of flight
  - Dynamic environment
    - » Air Traffic Control commands
    - » Required changes in path, altitude, airspeed, and aircraft configuration during descent
  - Complex device
    - » Advanced automation system with rich information displays
    - » Required programming tasks, operating mode selection, etc.
- Modeling Focus: Pilot use of automation modes during descent
  - Vertical Navigation, Vertical Speed, Flight Level Change



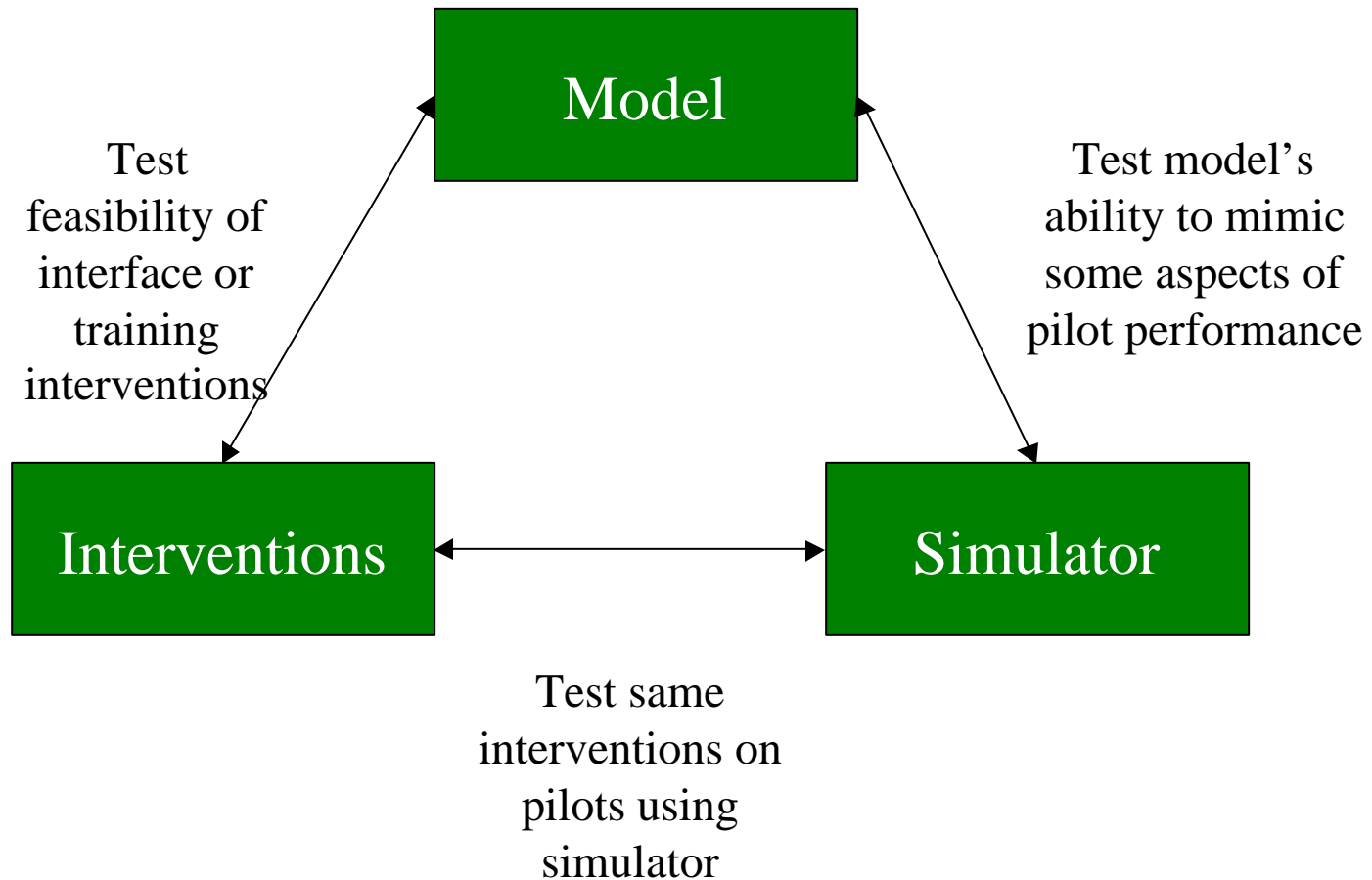


## *Modeling Goals*

- Understand cognitive processes underlying pilot performance in automated cockpit
- Use that information to develop interventions to improve performance
- Evaluate effect of interventions using the model



# *Cognitive Modeling Approach*





## *Task characteristics of “Flying a highly automated aircraft”*

	<i>“Flying”</i>	<i>“Typical” ACT-R Task</i>
<i>Example Task</i>	Flying down from cruise altitude to final approach fix with several altitude and speed restrictions	Memorizing lists, Judging statements, Tower of Hanoi
<i>Time scale</i>	Minutes to hours	Seconds to minutes
<i>Dynamic</i>	Environment changes rapidly and autonomously	Environment is relatively static
<i>Goal structure</i>	Heterogeneous goals	Single main goal & sub goals

⇒ New solutions have to be found to cope with these task characteristics

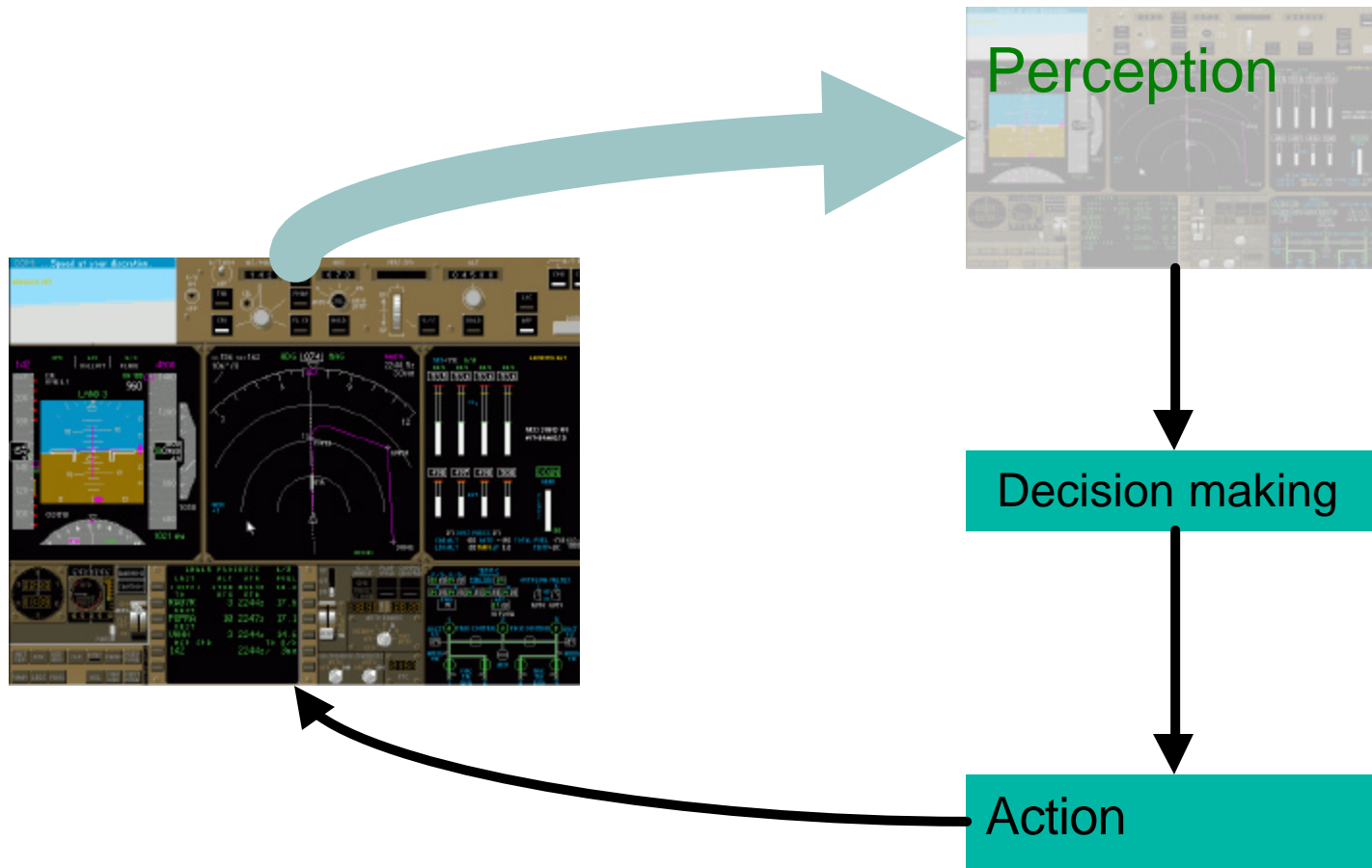


# Aerowinx B747 Desk-top Simulator Interface





# *Simulator and Single Pilot Model*







# *Representation of Procedural behavior and cognition: ACT-GOMS*

- “Translation” of NGOMSL to ACT-R 4.0
  - Memory representation for GOMS-level elements
  - New elements (methods, steps, operators, desired states)
- Added features:
  - Control structure (handling operational goals, intentions, and interruptions)
  - Goal stack limited to 3 levels (shallow)
  - Activation-based retrieval of goals and steps



# *Example for NGOMSL Level*

**Encode Clearance ...**

**Decide Descent Method**

retrieve target altitude

enter MCP altitude

SR: Waypoint in clearance? (yes)

**Calculate S**

get altitude

encode altitude

retrieve target altitude

encode target altitude

subtract the two values

encode result

**FLCH Descent**

press FLCH

wait (5 seconds)

retrieve target waypoint

check-green-arc

SR: green arc aligned with waypoint? (no)

SR: too steep? (yes)

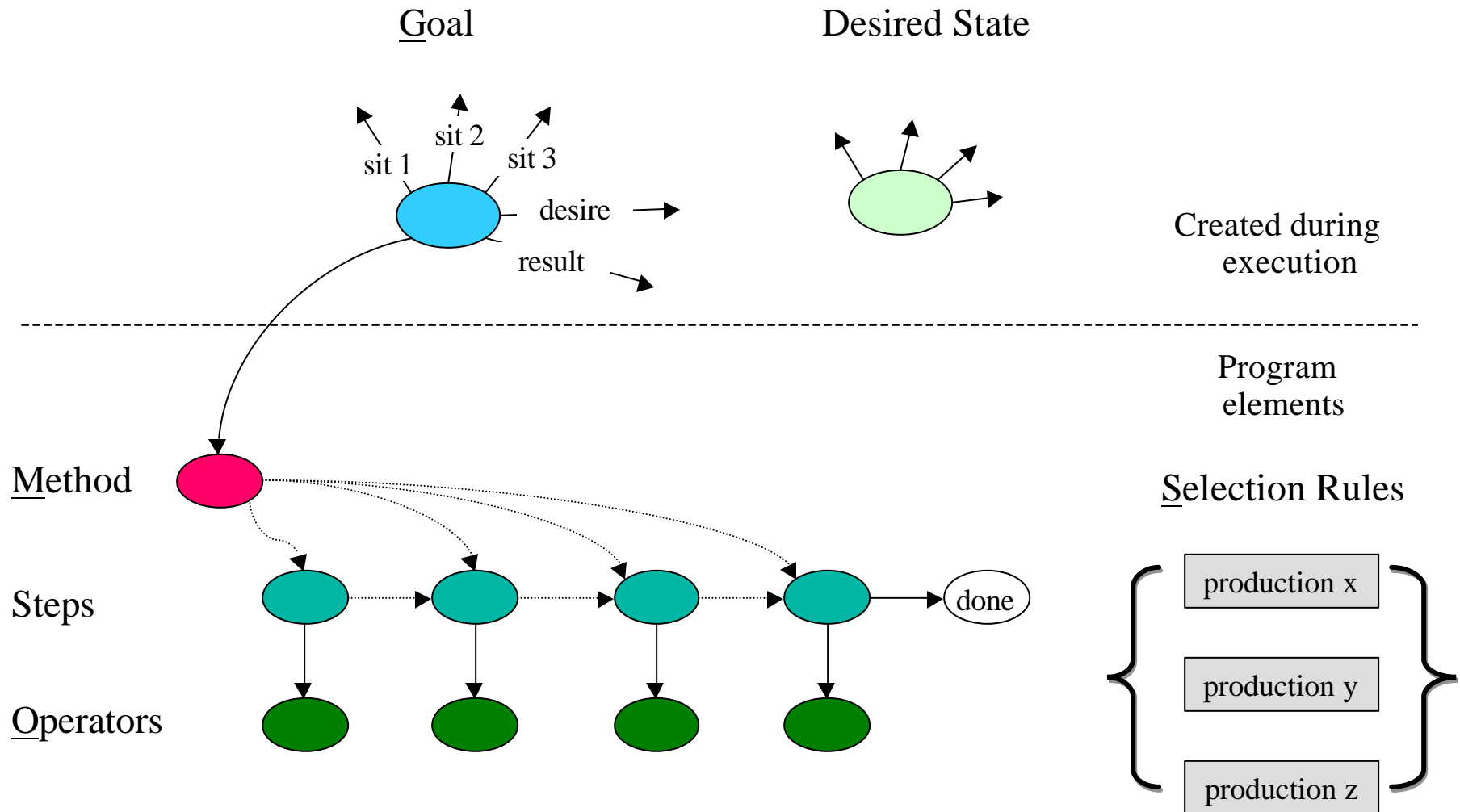
decrease MCP speed

wait (5 seconds)

go to step 4



# ACT-GOMS details







# Goals

## Desired State

(represents the target state)

```
(chunk-type d-state
  type
  p1
  p2
  p3
  p4
  parent)
```

## Step-specific goals

### Main Goal Type

(created to carry out a method)

```
(chunk-type main-goal
  mode
  s1
  s2
  s3
  desire
  result
  method
  step-type
  step
  operator)
```

### Basic Goal

(always on bottom of the goal stack)

```
(chunk-type basic-goal
  rehearsal-chunk
  focus-chunk
  n
  result)
```



# Operators

Each step in a procedure uses 1 operator (unless it is a step calling a new method)

3 basic types of operators are used

→ Internal operators

- mental calculations, comparisons, memory operations, etc.
- one production per internal operator

→ External operators

- pushing buttons, entering values, etc.
- fixed sequence of generic productions to execute the operation

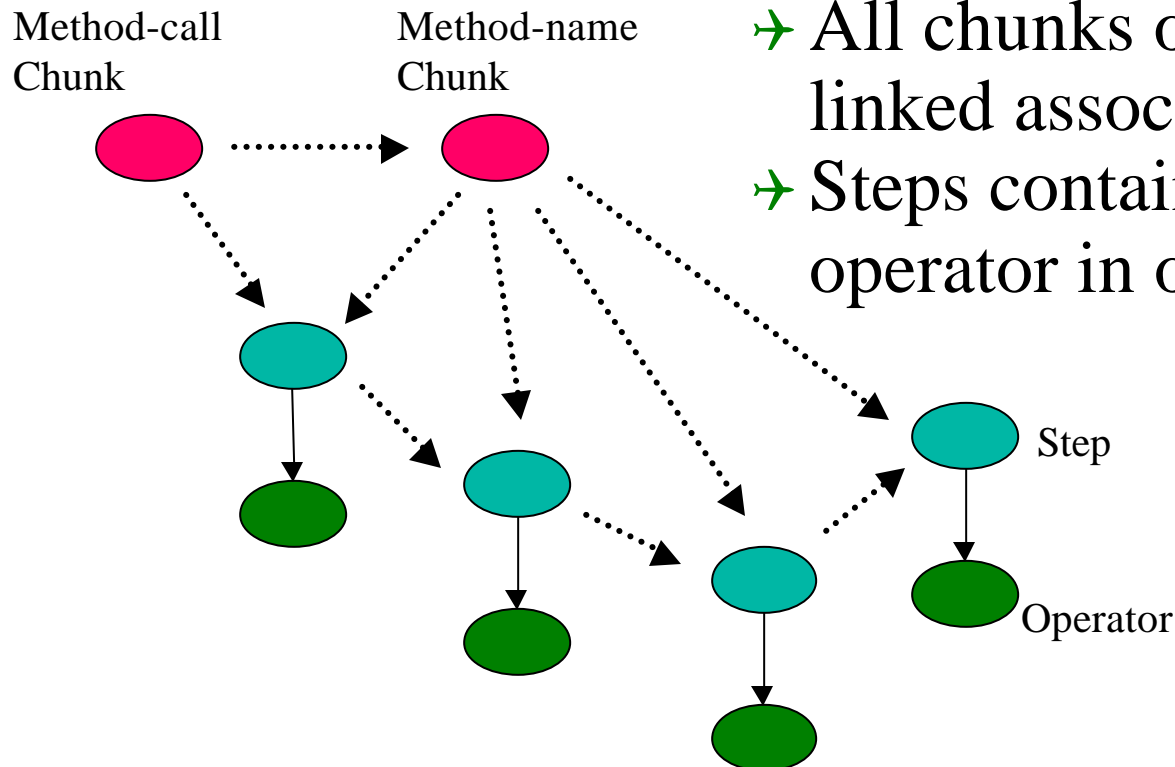
→ Perceptual operators

- reading displays, verifying displayed values, etc.
- fixed sequence of generic productions to obtain the perception
- each perceptual step results in the creation of an episodic representation of the perceived value



# Methods

- Methods are represented as a method-call chunk, a method name chunk, and a number of steps
- All chunks of the group are linked associatively ( $S_{ji}$  values)
- Steps contain the name of an operator in one slot





# Selection Rules

→ Selection rules are represented as steps in a method; they trigger certain productions<sup>1</sup>

- Selection rules determine:
- branching: which methods to try to activate next
  - termination of methods that have a termination condition

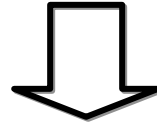
<sup>1</sup>very much like an internal operator,  Operators

```
(p decide-to-use-vnav
=goal>
  isa main-goal
  step-type 'sr
  method n-calcs1
  result =s
!eval! (<= =s 250)
=method>
  isa method
  name n-vnav
==>
=goal>
  isa main-goal
  op =method
  step-type 'meth
  result nil)
```



# *Current Approach to model building*

**Task Analysis  
Knowledge elicitation**



**Procedural Steps (operators),  
Methods, Selection Rules**

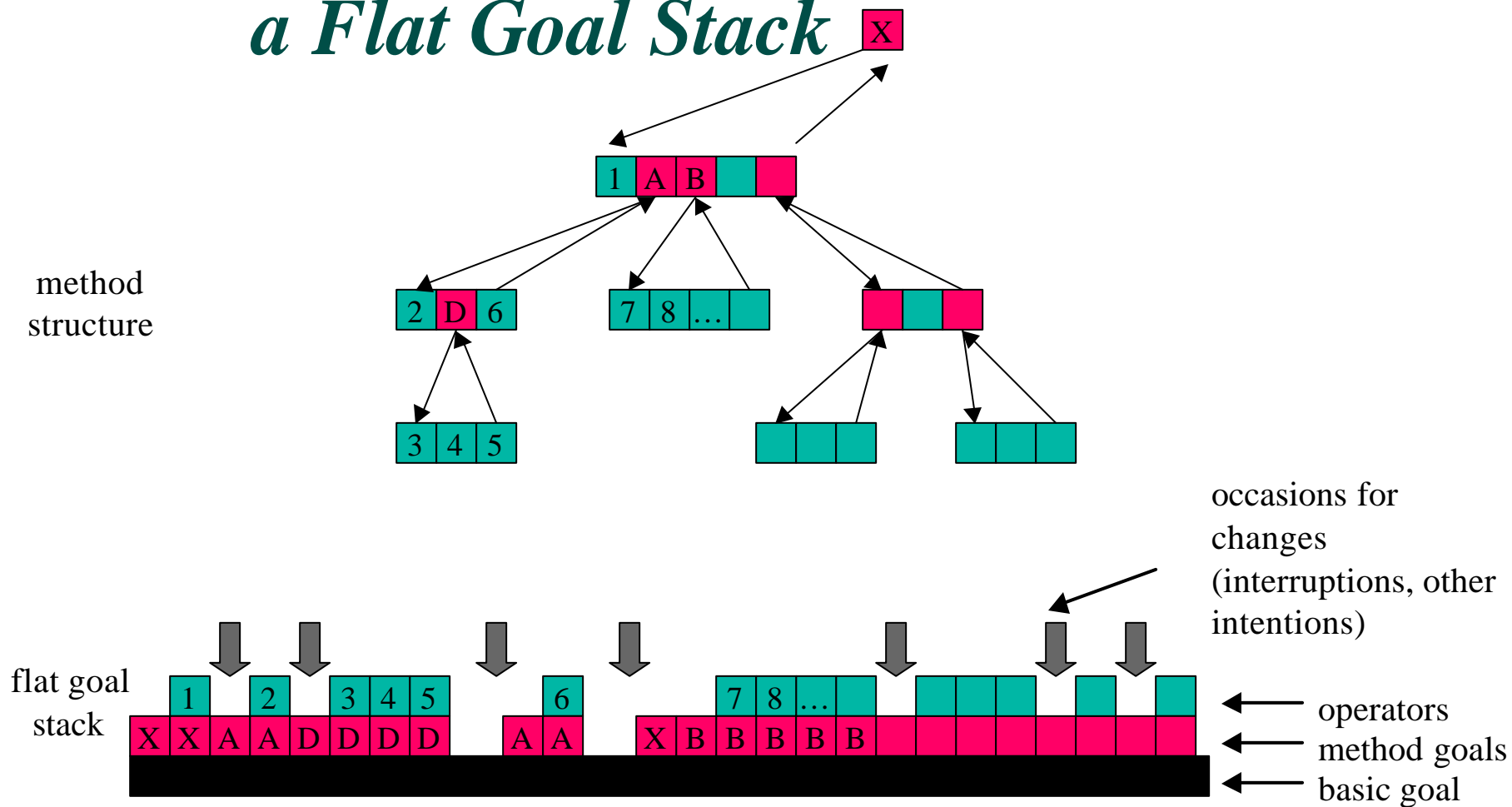


**Act-GOMS-basis**

**Act-R 4.0**



# Hierarchical Methods executed with a Flat Goal Stack



(cf. Altmann & Trafton, 1999)



# Goal Operations with Deep vs. Flat Goal Stack

	<i>Deep goal stack</i>	<i>Flat goal stack</i>
<i>On begin of new method</i>	push new goal	rehearse current goal, replace it with new goal
<i>On end of method</i>	pop old goal	pop old goal, retrieve next goal from memory <sup>1</sup>

<sup>1</sup> Next goal can be part of “the plan” but also an intention or an interruption.  
⇒ This makes the model flexible, but also vulnerable to procedural errors.



# Get Goal

```
(p get-goal
  =goal>
    isa basic-goal
    result =result
    reh-chu nil
  =other-goal>
    isa main-goal
    mode =mode
==>
  =goal>
    foc-chu nil
  =other-goal>
    mode nil
    result =result
  !push! =other-goal
  !output! ("Found ~A, Mode ~A" =other-goal
    =mode)
)
```

Triggers when goal stack has only the basic goal on it

Selects most active available main-goal.  
Retrieval competition: No symbolic linking

Pushes main-goal as level 2 on stack



## *Get Step*

```
(p get-step
```

```
=goal>
```

```
  isa main-goal
```

```
  step-type 'next
```

```
  op =op
```

```
  et =et
```

```
=step>
```

```
  isa step
```

```
  type =type
```

```
  orga =orga
```

```
  - operator =op
```

```
  operator =on
```

```
==>
```

```
=goal>
```

```
  step =step
```

```
  op =on
```

```
  step-type =type
```

```
  next =orga
```

```
!output! ("retrieved ~S" =on)
```

Triggers when goal stack has a main goal on top which requires a next step

Selects most active available step of any type.

Retrieval competition: No symbolic linking

The step slot in the main-goal is set to the name of the step





# *Advantages of Associative Linking of Steps*

- Occasional step skipping during performance, particularly under high working memory load
- Deviations from a strictly linear sequence of steps are possible (e.g. shortcuts)
- No special learning mechanism needed (ACT-R associative learning does the job)

⇒ A more realistic representation than symbolic linking?





# *Lessons Learned from the Single Pilot Model*

- ➔ Unique features of single pilot model
  - GOMS-level approach implemented
  - Flat goal stack
- ➔ Issues
  - Model performs perfectly OR gets lost
  - Learning of  $S_{ji}$ s caused problems



# *Modeling the crew system*

- Context: Two-pilot crew operating a commercial aircraft during descent phase of flight
  - More complete task analysis
    - » Large hierarchy of linked goals with lower-level steps
    - » Scripted by checklists and Flight Operations Manual
  - Two-pilot crew
    - » Pilot Flying and Pilot Not Flying task division
    - » Communication between pilots (and ATC)
- Modeling Focus: The communication and actions during descent
  - Two individual pilot models talking with each other
  - Leveraged from single-pilot automation model

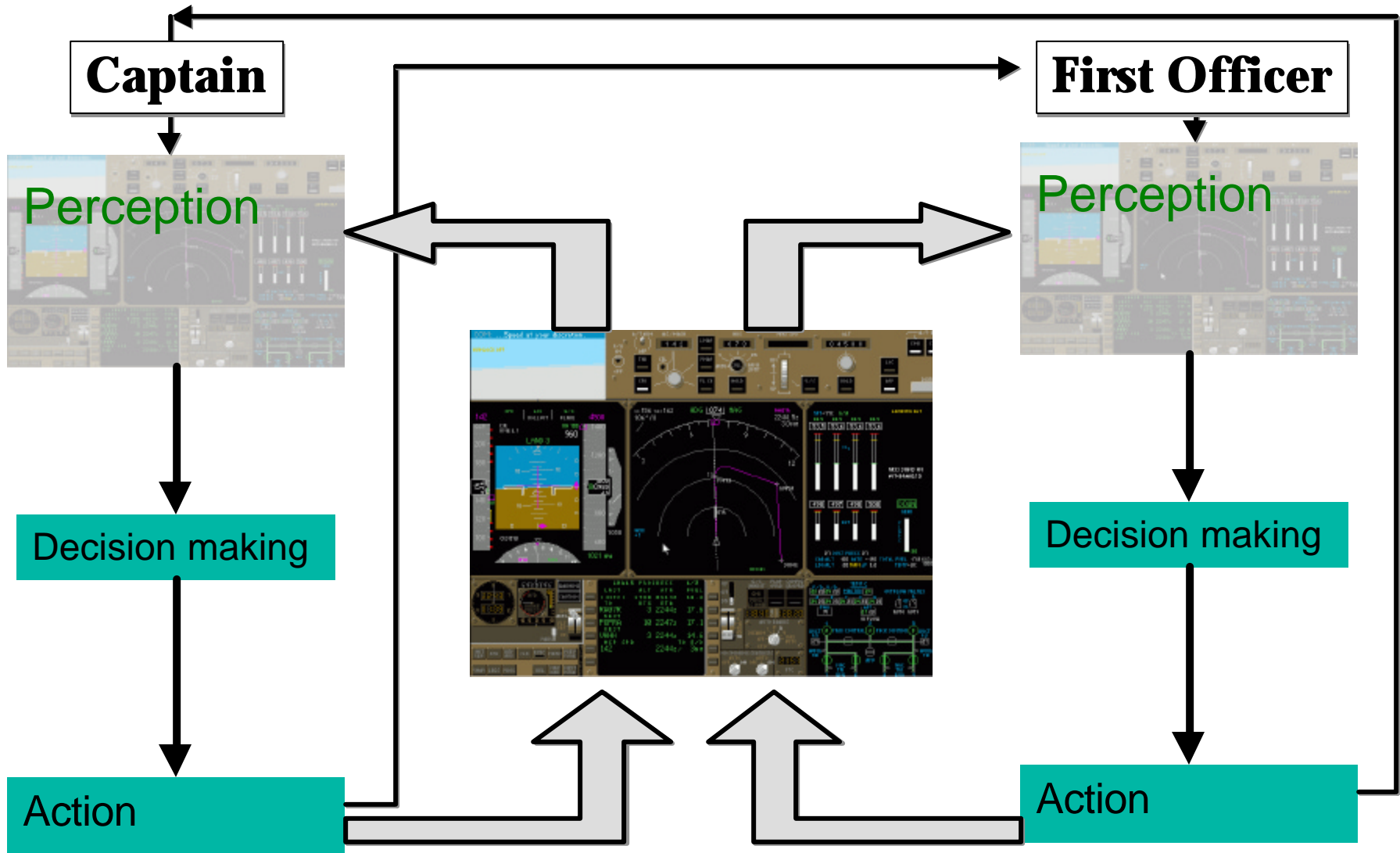


# *Modeling Goals*

- Model crew automation interaction
  - Explore effects of specific aspects of crew experience and workload on simulated task performance
- Improve assessment of real crew performance based on model results
- Applications:
  - Training
  - Proficiency evaluation



# *Simulator and Crew Model*





# *Constructing a crew model*

## → PF model

- Receive ATC clearances
- Decide on descent mode of FLCH, V/S, or VNAV
  - » change mode of descent when necessary
- Monitor A/C status, weather, traffic...
- Divide other flight tasks with PNF
- Communicate with PNF

## → PNF model

- Do appropriate checklists
  - » Program FMS for descent
  - » Other checklist tasks
- Do other flight tasks
  - » get / set radio freq.
  - » approach plates, etc.
- Communicate with PF
  - » Required communication such as required briefings
  - » Optional communication
- Communicate with FA, PAX, etc.

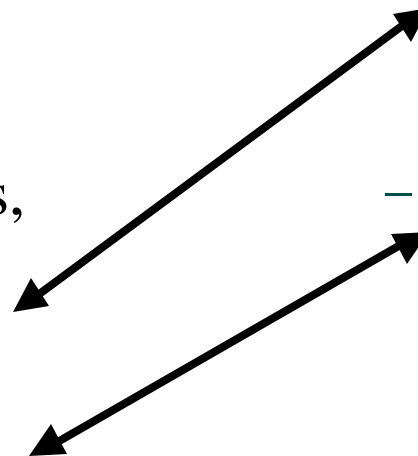
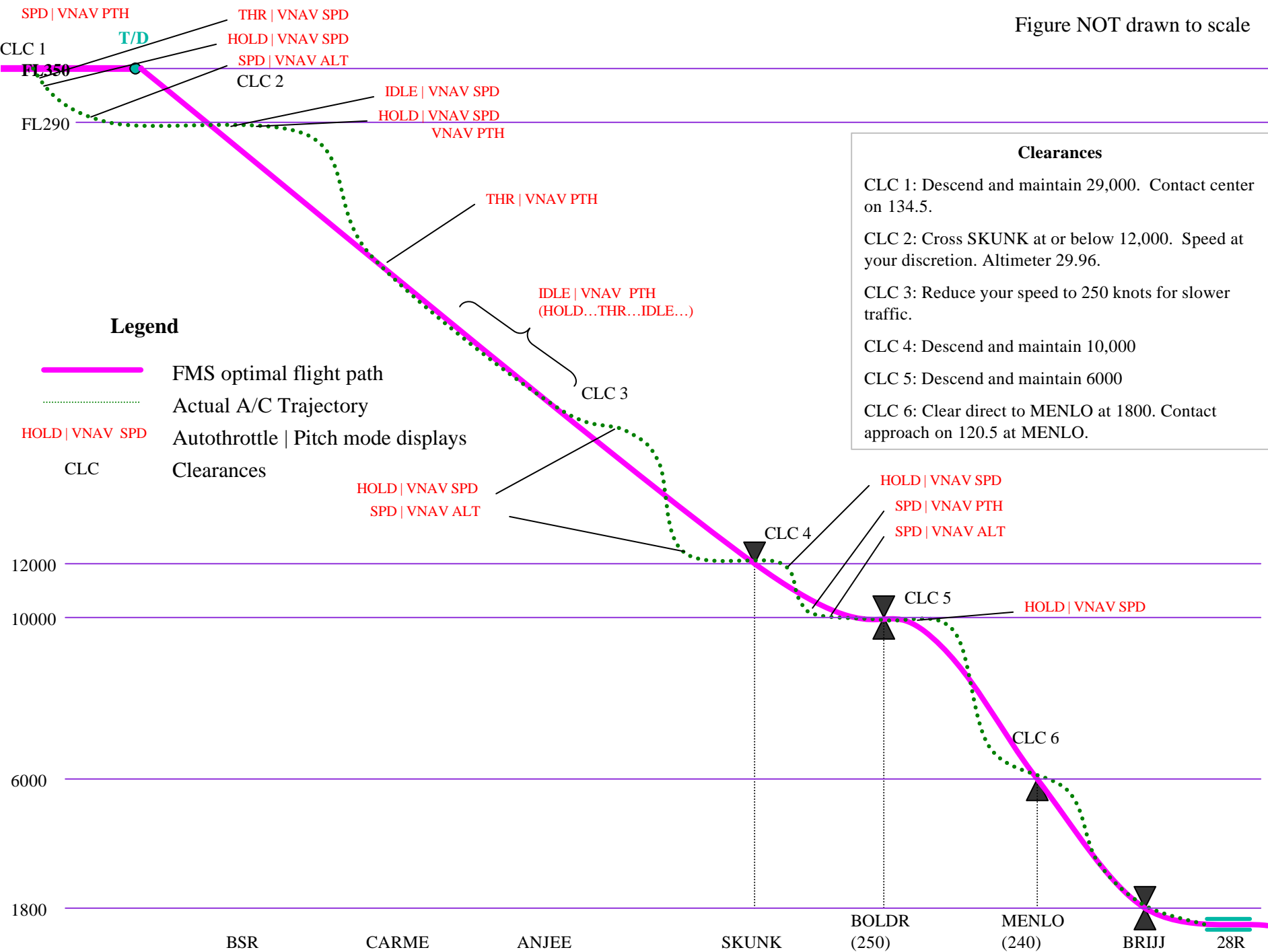




Figure NOT drawn to scale





# *Overview of Model Structure*

- Uses the ACT-GOMS representation of procedural knowledge
- Procedural behavior based on Single Pilot Model (ACT-R 4.0)
- Does not currently interact with a real simulator
- Task analysis based on checklists and flight operations manual of a major airline; cognitive analysis carried out with SMEs
- $S_{ji}$ s specified a priori rather than learned



# *Pros and cons of ACT-GOMS*

## → Pros

- Direct translation of task analysis to methods and steps in the model
- Natural production of certain qualitative results:
  - » Omission errors: e.g. Step-skipping
  - » Commission errors: e.g. intrusions from other sub-tasks
  - » Factors influencing procedural performance:
    - “Expertise effects” (higher Sji s)
    - Higher goal activation
    - activation noise
  - » Interruptions by other tasks
  - » Forgetting of goals over long time intervals

## → Cons

- Not parsimonious
  - » Debugging difficult: ACT-GOMS <-> ACT-R <-> Lisp
- More parameters to set and adjust to fit human data

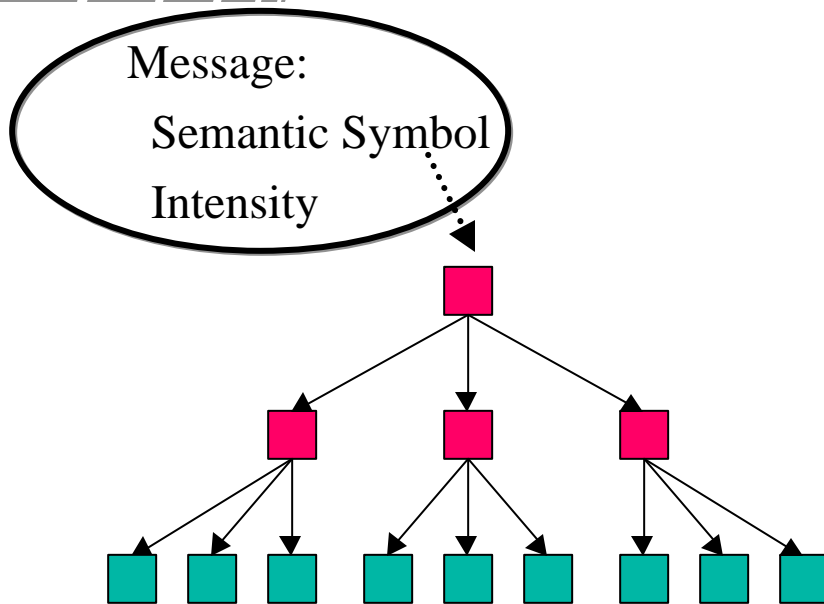


# *Issue 1: Communication between models*

- ➔ ACT-R *MultiModel* extension provides the “pipe” between the models
  - Still under development
  - “Speaker” model creates a 2-tuple message:
    - » a semantic symbol; e.g. Put-down-flaps
    - » an intensity; an integer value used to influence the base-level activation of the message chunk in the “listener” model.
  - “Listener” model polls its MultiModel input buffer (“Did I hear something?”) on every cycle.
  - On receiving a message, a goal chunk is created and is rehearsed the number of times indicated by the intensity.
  - Recognition of the goal/message chunk is subject to activation-based retrieval through Get-Goal



# Issue 1: Communication (continued)



Communication message creates a goal to execute a pre-existing hierarchy of methods and steps.

But message could also specify a change-of-order from the normal procedure.(e.g. gear before flaps)

Implementing different types of messages may be necessary.

A complete version of message transmission may require some version of natural language processing.



## Issue 2: Goal decay and “death”

→ Our solution is periodic monitoring of external environment for goal cues followed by goal rehearsal

→ Example Code

```
(p Refresh-Goal
  =goal>
    isa BASIC-GOAL
    reh-chu nil
    misc =rtime
  =most-active-undone-main-goal>
    isa main-goal
    mode =mode
    - step-type 'done
  !bind! =current-time (actr-time)
  !eval! (< =rtime (- =current-time *monitor-cycle-time*))
==>
  =goal>
    misc =current-time ;resetting the time
  !eval! (rehearse-chunk-fct (list =most-active-undone-main-goal)
  :repeat *checkpoint-rehearsals*)
  !eval! (mod-chunk monitor-environment method n-monitor step
  nil-c op m-monitor step-type 'next)
  !eval! (push-goal monitor-environment)
)
```

Triggers when goal stack has only a basic goal and sufficient time has elapsed from the last refresh cycle.

Rehearses most recent main goal and pushes goal to check environment for goal cues.



## *Issue 3: Transition to ACT-R 5.0??*

- ➔ Want the group's feedback and input here!
  - Embodiment of cognition and buffers is a big plus
  - What are the implications of the other changes in the architecture?
  - How will we treat the  $S_{ji}$ s?  $S_{ji}$  learning?





## *Summary*

- We developed a layer for ACT-R 4.0 for handling procedural behavior and cognition
  - Associatively linked Methods and Steps
  - Shallow goal stack with competitive retrieval
- Approach applied to single-pilot use of automation during descent
  - Generalized to development of a crew model





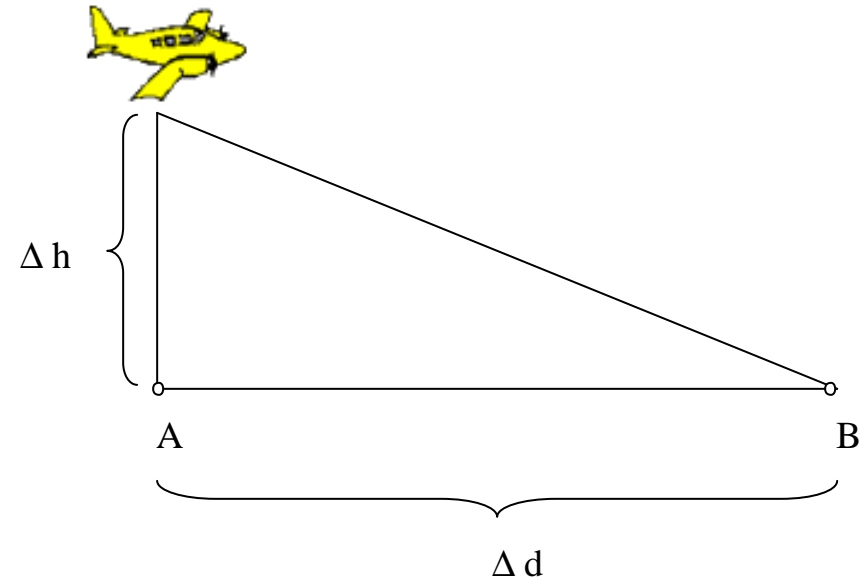
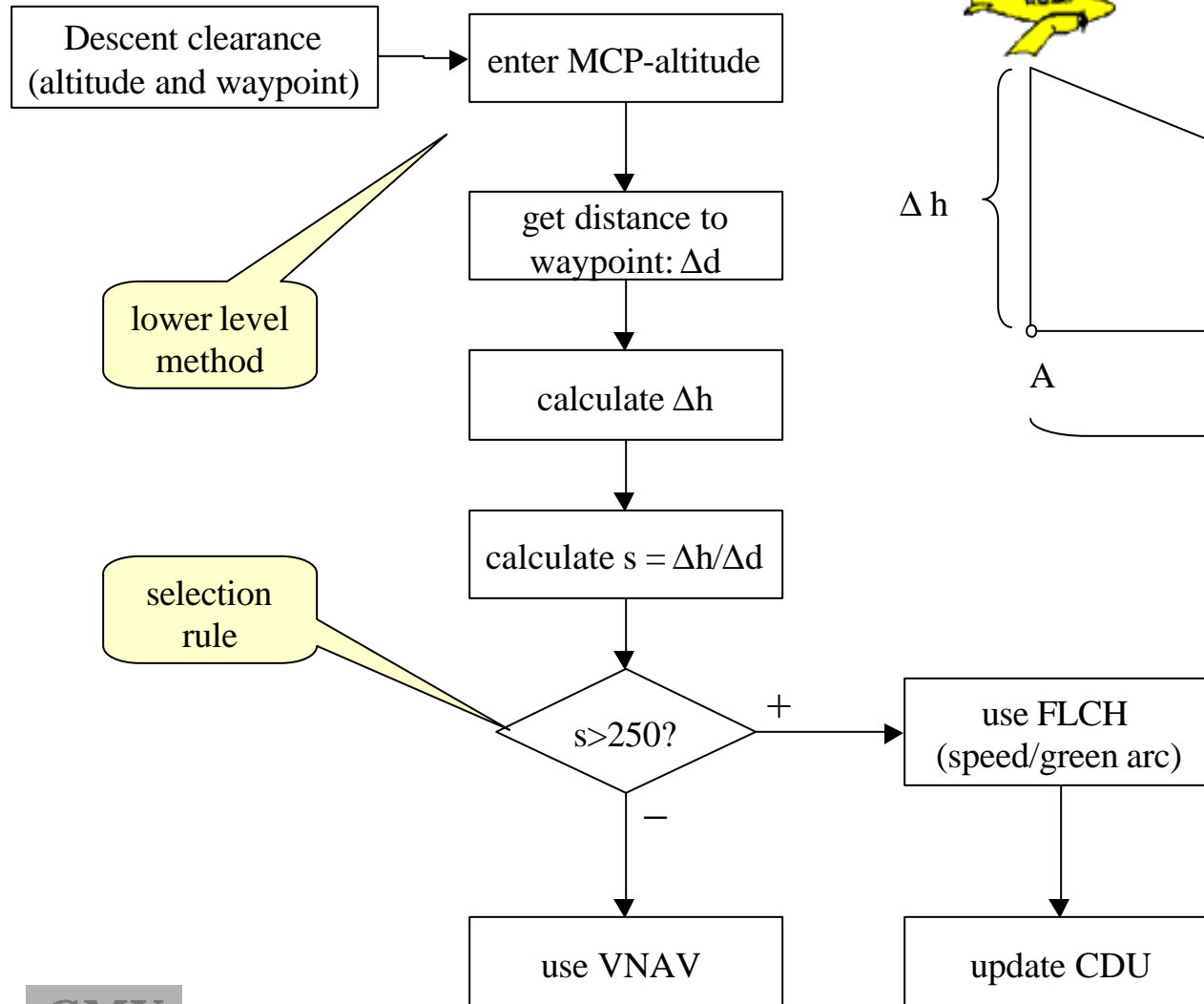
# *Discussion?*





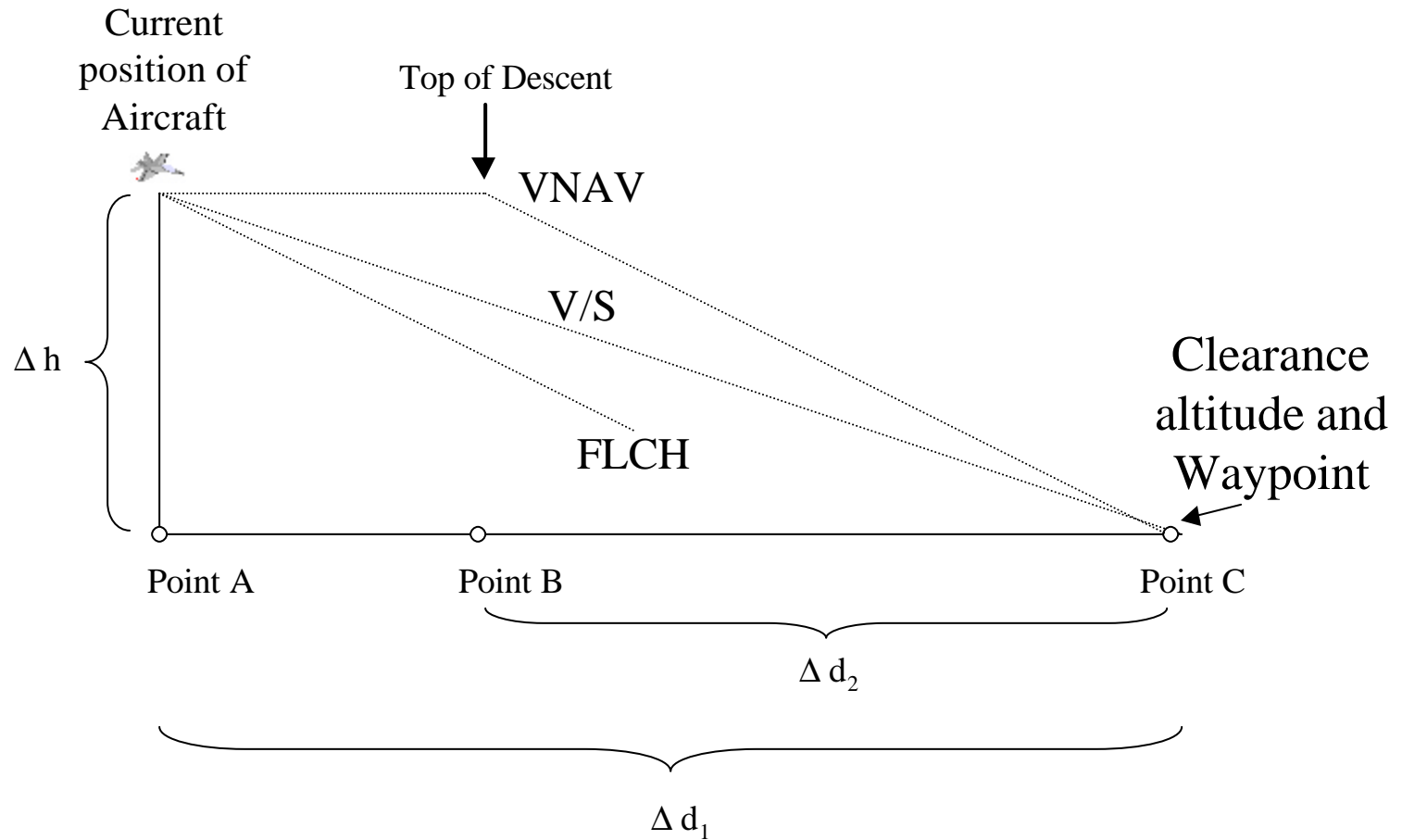


# Example High Level Method



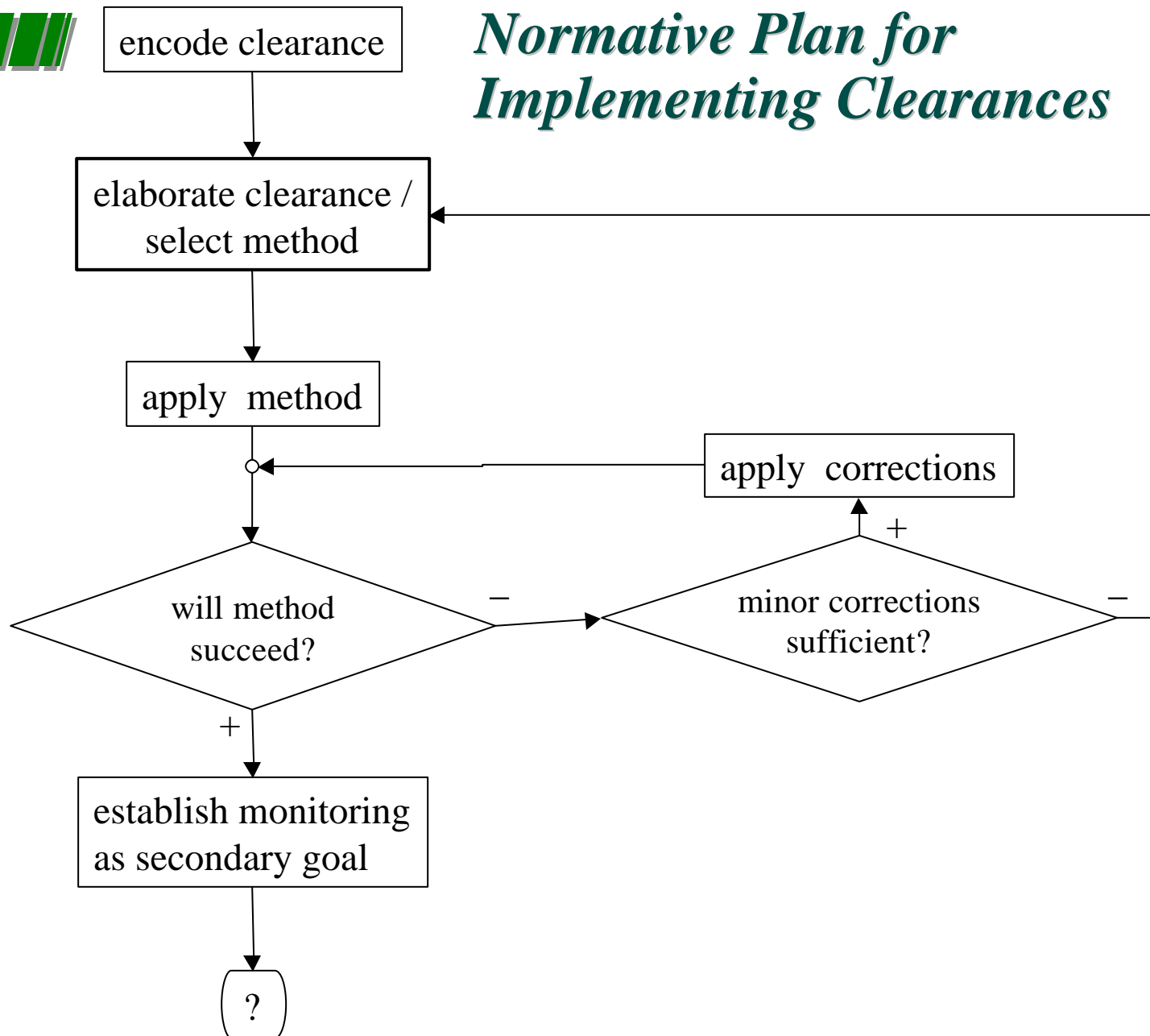


# Pilot's Descent Options



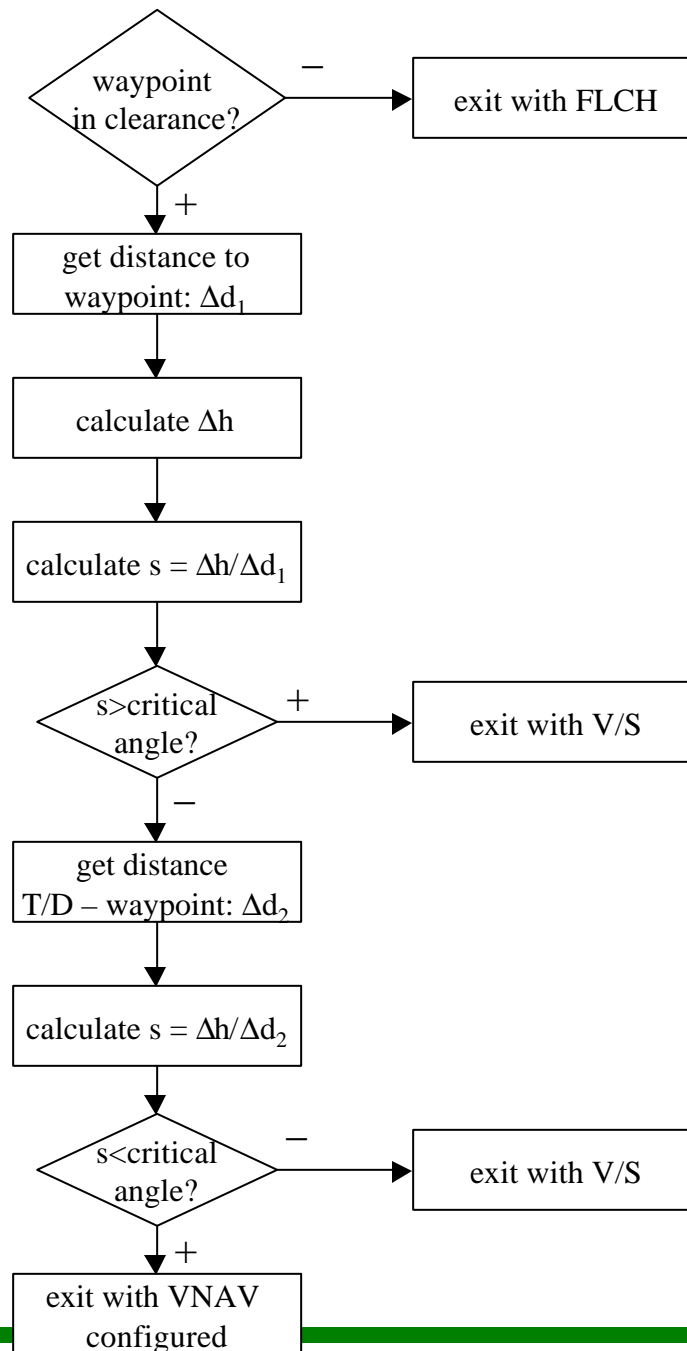


# *Normative Plan for Implementing Clearances*





## Elaborate Clearance / Select Method





# *Example NGOMSL Method*

## **MFG: Change altitude using V/S wheel (Assume VNAV, ATT, AP engaged)**

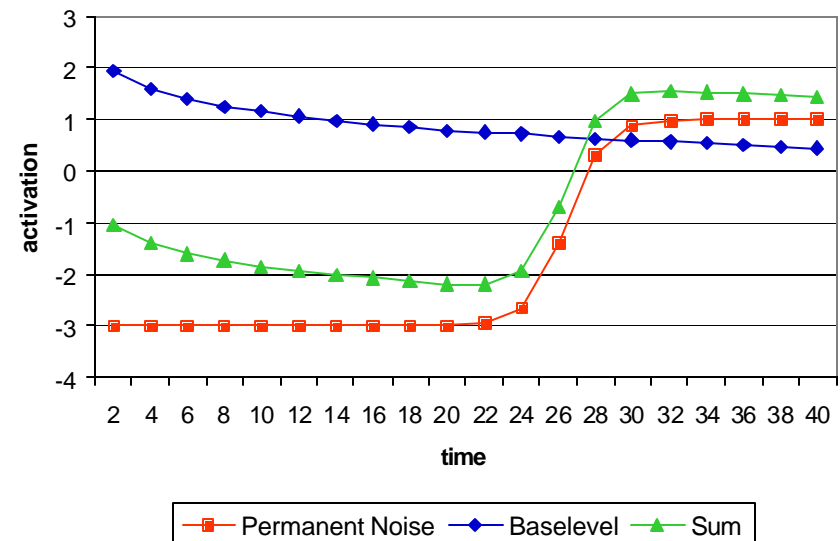
- Step 1     Verify FMA shows ALT on pitch mode
- Step 2     AG: Change MCP Alt
- Step 3     Rotate V/S wheel up (for climb) or down (for descent) to set rate of descent
- Step 4     Check V/S button is activated
- Step 5     If not activated, push the V/S button
- Step 6     Monitor for alt capture and subsequent hold
- Step 7     Return with goal accomplished



# Intentions

- Some methods contain special steps that form intentions (deferred actions)
- Intentions are represented by chunks of type main-goal
- Goals that represent intentions compete with all other goals for retrieval
- Preliminary solution for suppressing intentions for a while: adding permanent noise

```
(clrc-1 isa step type 'meth  
operator m-encode-clearance)  
  
(clrc-2 isa step type 'sr)  
  
(clrc-3 isa step type 'intend  
operator m-check-success)  
  
(clrc-4 isa step type 'intend  
operator m-waypoint-close)
```

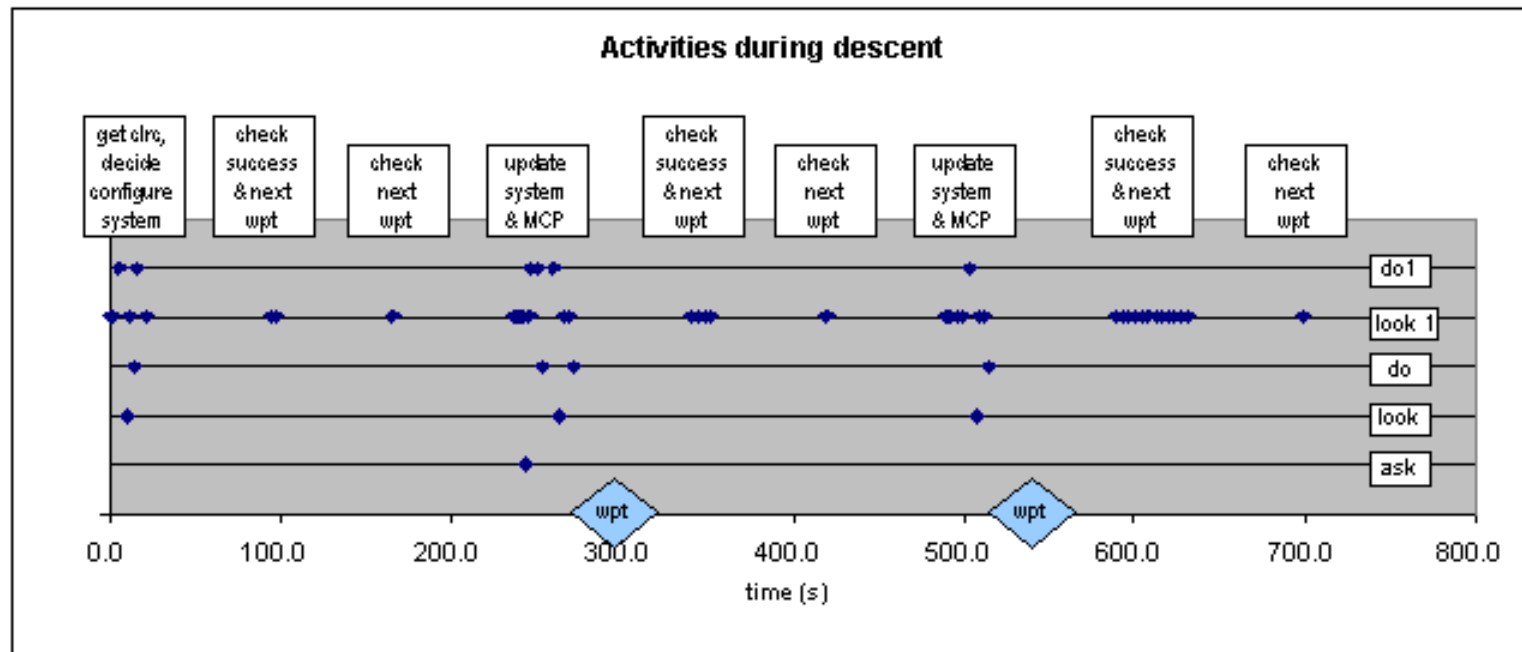


⇒ Important point here: the existence of the problem, not the solution



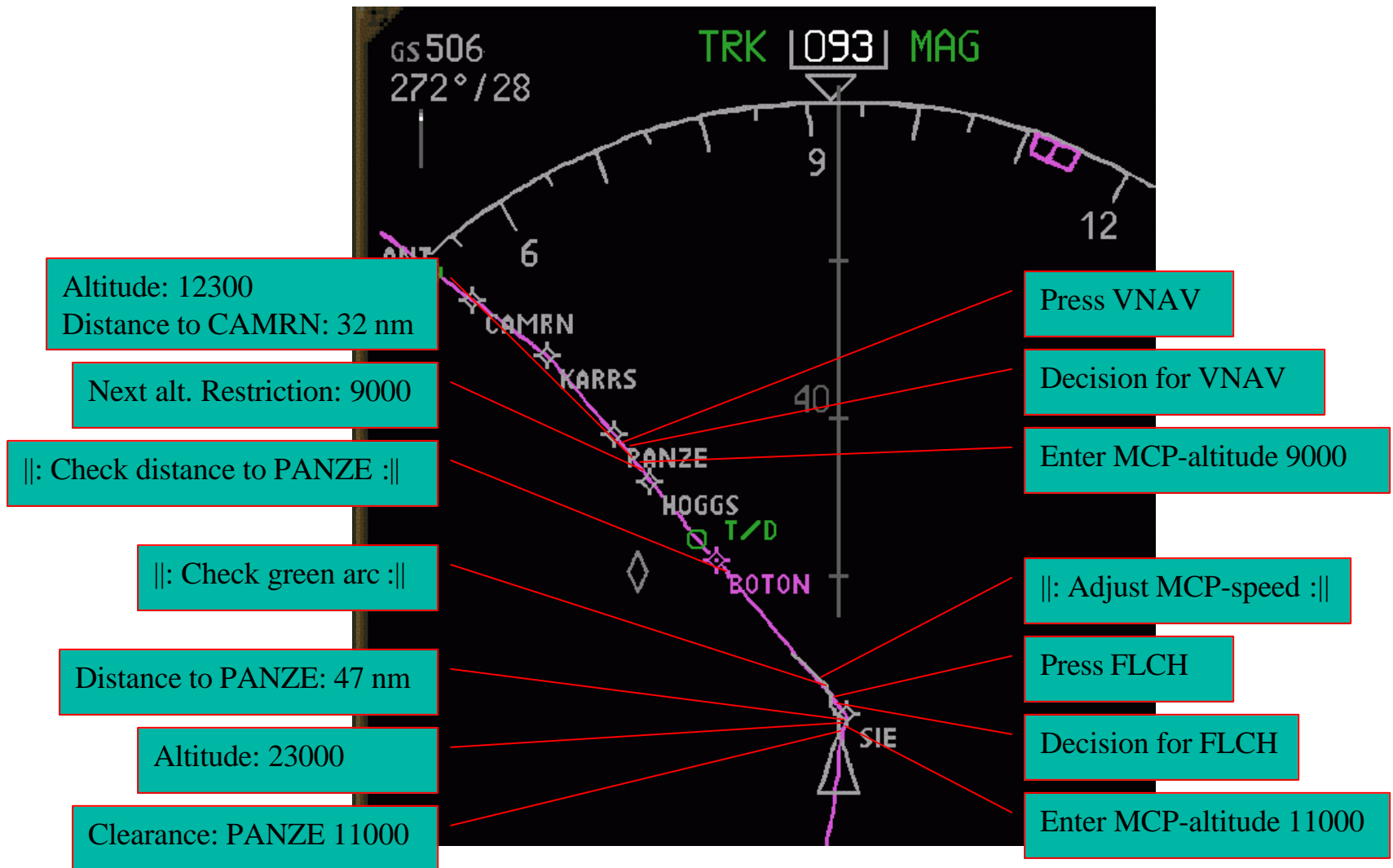
# Model Behavior (I)

The scenario begins with a descent clearance; the model flies the simulated Boeing 747-400 from 23000 ft down to 10000 ft



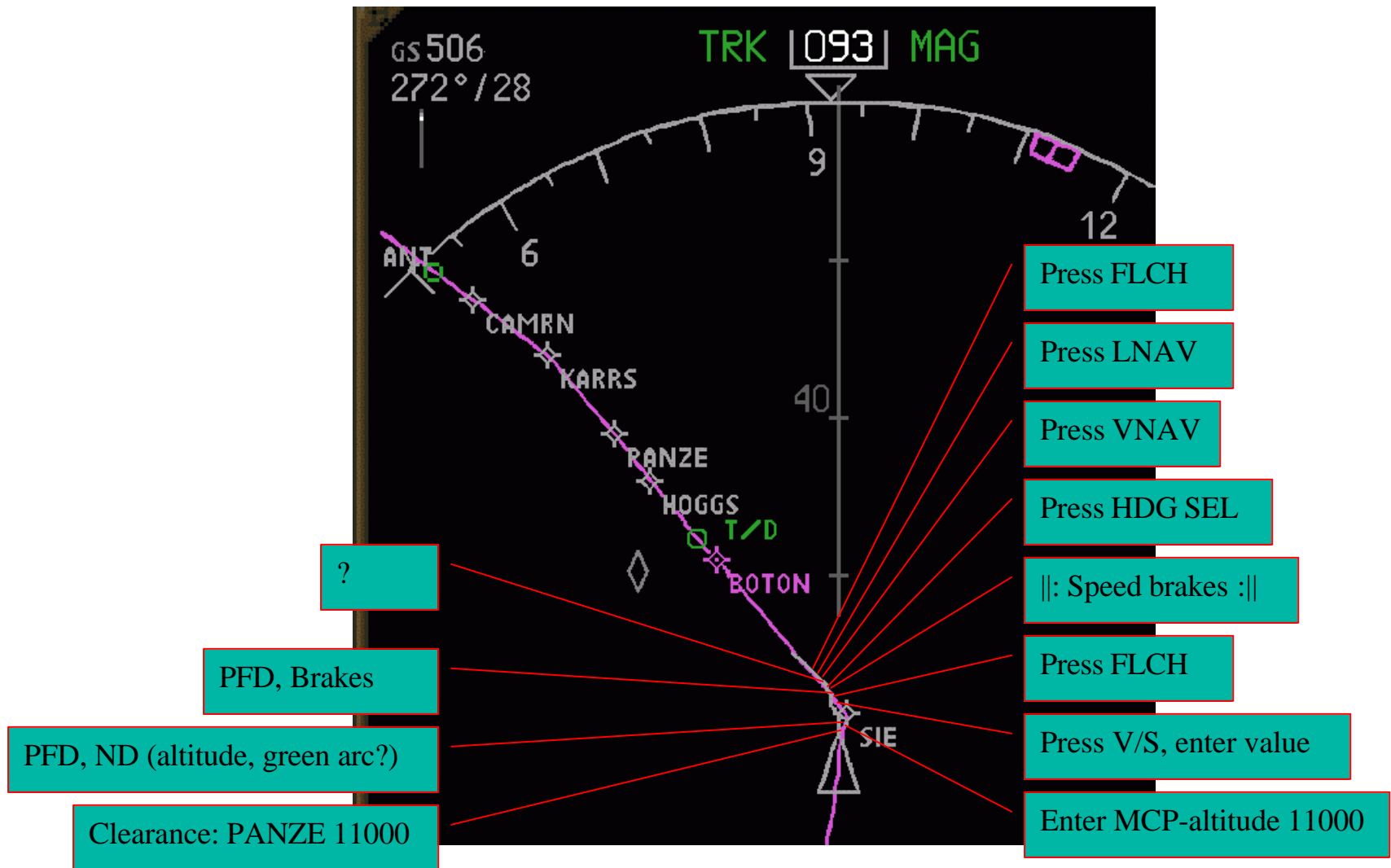


# Model Trace





# Subject Trace





# *Single-Pilot Research*

- Interaction with 747-400 FMS
- Study 1
  - Purpose was to inform single-pilot cognitive model
  - 5 UAL pilots flew a desk-top simulator for 2 legs
  - Eye-track, verbal protocol data collected
- Findings
  - Differences in scan strategies
  - During cued recall, pilots unable to recall FMAs



# *Single-Pilot Research*

## ➤ Study 2 – Follow up

- Goal is to further explore FMA confusion
  - » Each pilot will act as Pilot Monitoring while watching videotape 747-400 simulator flying a descent scenario using FMS LNAV and VNAV
  - » Descent scenario designed to emphasize uncommanded/surprising mode changes
  - » Videotape will be paused and knowledge measured at specific points in the scenario
- Uses single-pilot model to explore possible interventions that will facilitate FMA understanding





## *Using the crew model*

- Currently building the crew model
- Use model to identify factors affecting crew performance, e.g.:
  - task interruptions
  - high vs. low mental workload?
- Translate the effects shown by the crew model into guidance for assessment and training





# *Crew Processes*

- Crew model should include some representation of crew-level processes relevant for automation
  - Information from interaction with airline Automation Philosophy and Training Group
    - » Subject-matter experts on automation
  - Information from Jeff Beaubien's dissertation research
    - » Normal sample of pilots from a major carrier during recurrent training





# *Crew Models*

## ➤ Goals:

- Model crew automation interaction
- Improve assessment based on model

## ➤ Crew interaction model will focus on communication and actions

- Two individual pilot models talking with each other
- Leveraged from single-pilot automation model